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Capabilities/Gaps Assessments

**Sharing of Center-Specific Pilot Programs** 

**Defining Powerful Cross-Center Pilot Ideas** 

**NASA AI Workshop Series** 

**Creation of New Center Institutes Dedicated to DS and Collaboration** 

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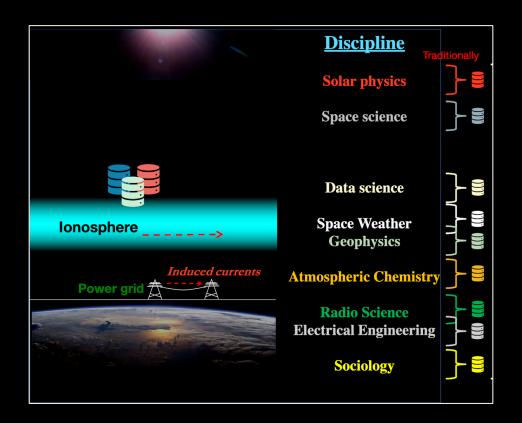
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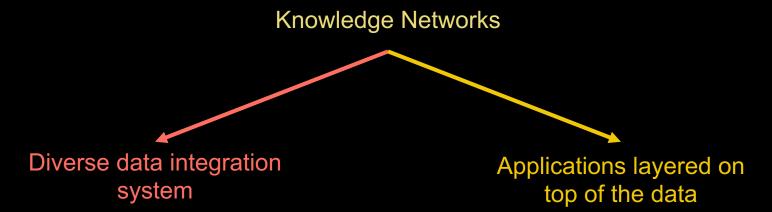
GICs = Geomagnetically Induced Currents



### **Respond to three Grand Challenges**

- (1) the **lack of a cohesive community**, owing to the wide variety of subject matter experts required,
- (2) the **lack of effective data sharing**, coordination, and analysis (e.g., data science)
- (3) the **diversity of physically dominant processes** in each part of the space weather environment







### NASA Search query

#### **Knowledge Panel**



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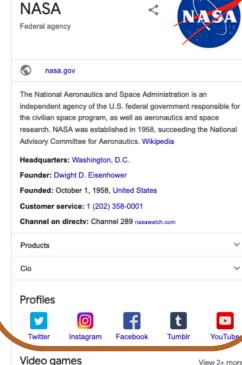
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NASA

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#### People also ask

What NASA stands for?





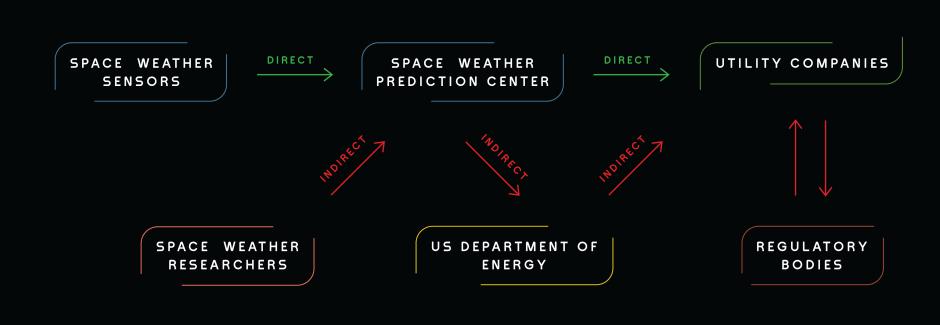


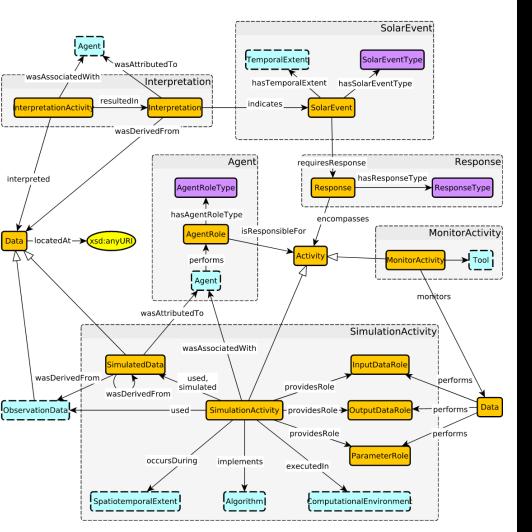






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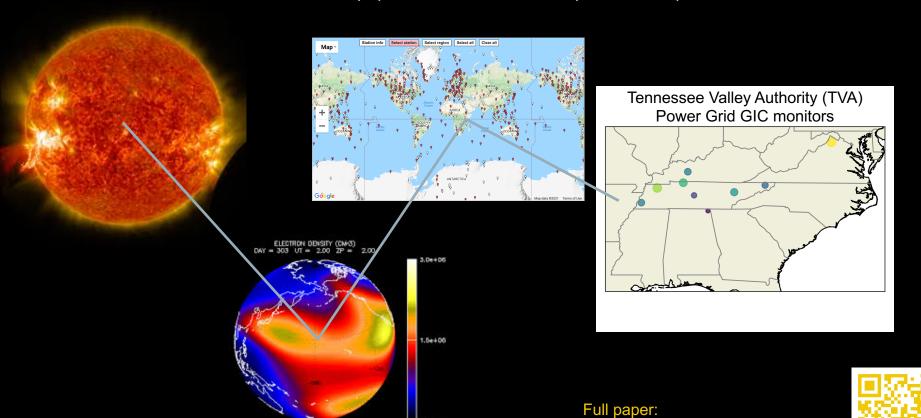


Full paper on the ontology: https://arxiv.org/abs/2009.12285



# CHESS

Highlight #1: Link GIC data to simulation data to remove quiet-time variation and create ML database to study space weather disturbed periods and predict GICs

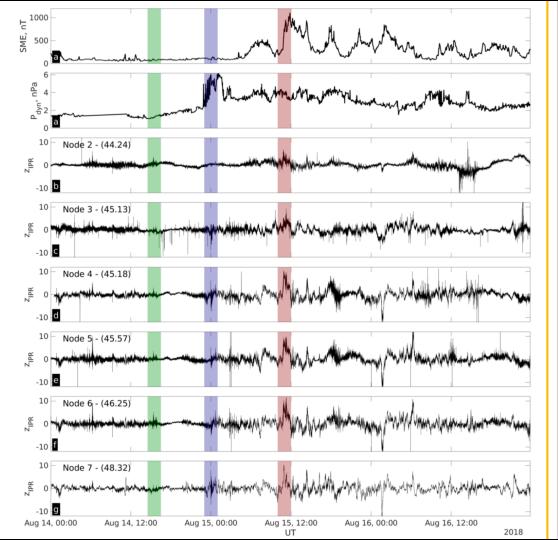


https://tinyurl.com/Kellerman2020

Reduced data wrangling with Knowledge Network approach: Reduce time to discovery

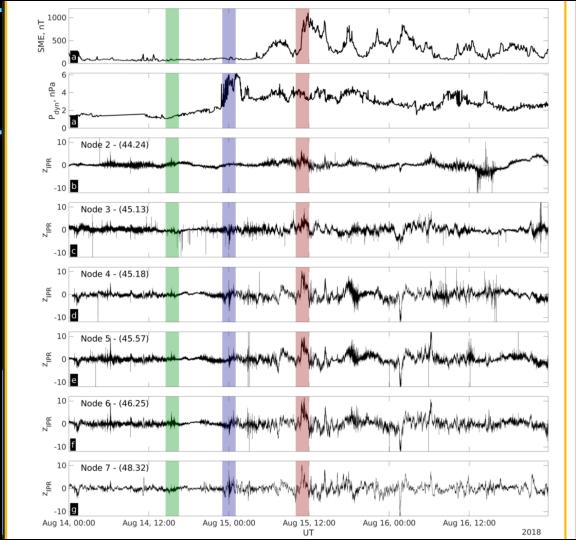
Used link to Global Circulation Models to discover and systematically remove quiet-time variation

→ Z-Score = Time series quiet variations removed



Reduced data wrangling with Knowledge Network approach: Reduce time to discovery

GIC time series aligned with solar wind and space weather activity time series



## GIC significance

Three events during a period of quiet to moderate geomagnetic activity

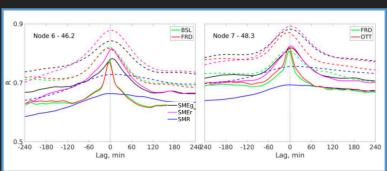
Event 1 – Quiet

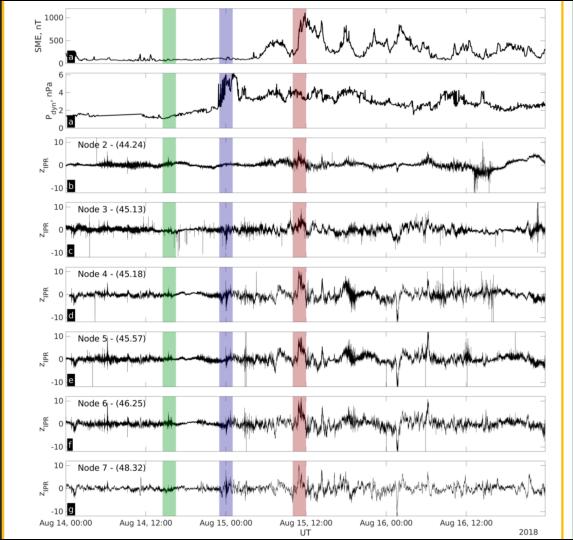
Event 2 – Elevated dynamic pressure, low SME

Event 3 – Elevated solar wind velocity, high SME

The observed GIC in event 3 is due to elevated geomagnetic activity, as defined by the SME

Cross-correlation analysis indicates a nearinstantaneous response to geomagnetic activity *Volatility in GIC and geomagnetic activity* 

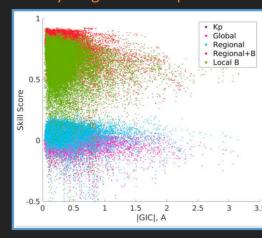


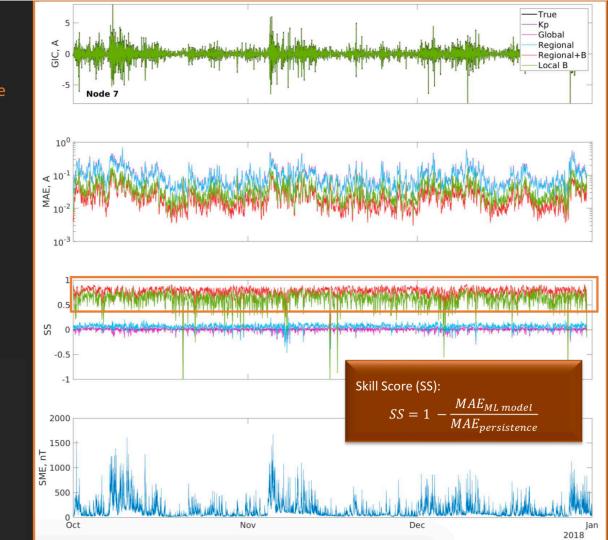


# GIC forecasting

SOCNN – 1-minute forecast.

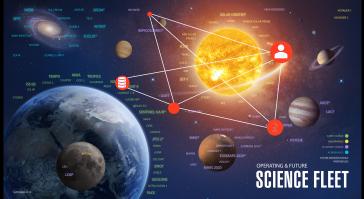
The most skillful models are those that include nearby magnetic field perturbations





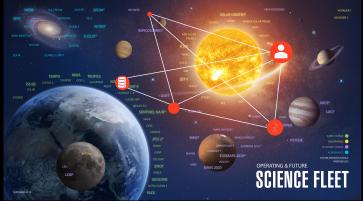
# A proposal: A model for crossing boundaries with data science

1 Knowledge graph formulation



## A proposal: A model for crossing boundaries with data science

1 Knowledge graph formulation



2 Ecosystem of 'boundary navigating objects' (e.g., Jupyter Notebooks based on use cases)

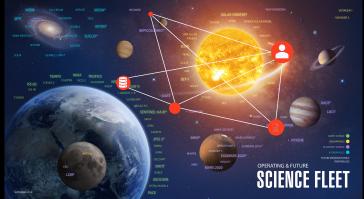






## A proposal: A model for crossing boundaries with data science

1 Knowledge graph formulation



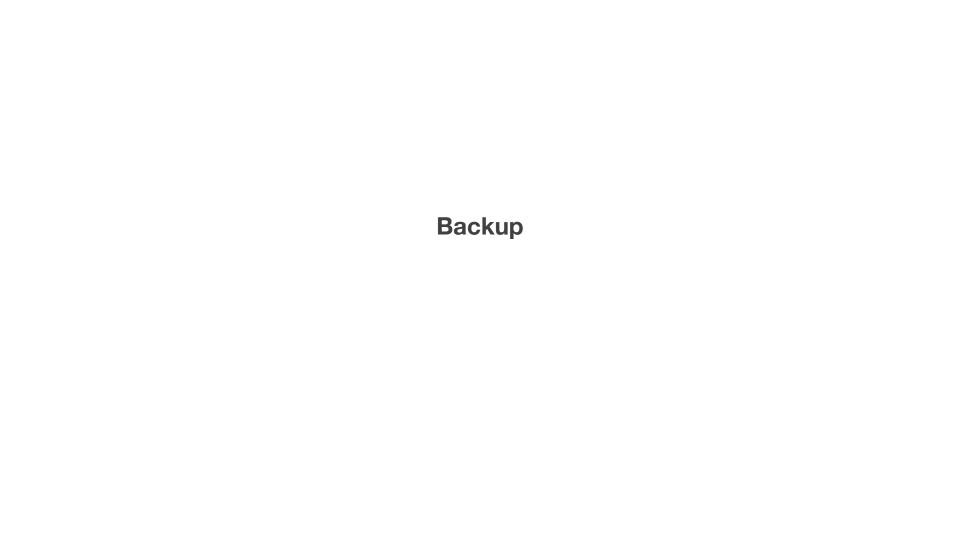
2 Ecosystem of 'boundary navigating objects' (e.g., Jupyter Notebooks based on use cases)











### Resources

- HelioAnalytics Goddard Space Flight Initiative to "harness advanced statistics, informatics and computer science methods to achieve science"
- Thought-leaders:
  - <u>Kirk Borne</u> and on <u>Twitter</u>
  - Joi Ito
  - Cesar Hidalgo
  - Andrew Ng
  - Barbara Thompson
  - Naval Ravikant
  - Hilary Mason
  - \*Expand your horizons with the papers that you read, the fields to which you pay attention, and the thinkers that you choose to learn from
- Compilations of resources
  - Non-traditional funding resources
  - Data science tools and resources
  - Data Science Success Stories from Science and Engineering
- Being 'antidisciplinary'/Convergent
  - MIT Media Lab
  - Fall AGU Town Hall 2018: "<u>Data Science and a New Scientific Frontier in Space Science</u>"
  - Fall AGU Town Hall 2019: "Antidisciplinary: Science and engineering in the digital age"
- Podcasts
  - Origins
  - Microsoft Research Podcast
  - Grey Mirror Podcast
  - Voices from DARPA
  - Artificial Intelligence Podcast
  - Data Skeptic

## Resources (cont'd)

- Camporeale et al., [2019]
- AGU Earth and Space Science Informatics (ESSI)
- National Research Council "Enhancing the Effectiveness of Team Science"
- Meetups, hackathons, and unconferences
- Open source communities (e.g., <u>Open Source Initiative</u>)
- Citizen Science
- Many resources to discover based on your own passions and search!